1   Original article

Constraints upon cheating emergence in mutualistic

networks: evidence in the mycorrhizal symbiosis

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Abstract

While multiple-partner mutualisms are widespread and essential in ecosystems,

cheaters often exploit mutualistic interactions and threat their stability. The persistence

of mutualisms relies on constraints upon cheating emergences: cheaters can be

constrained by interaction mechanisms preventing cheating or phylogenetic

conservatisms of interactions. By investigating the structures of interaction networks

and the patterns of phylogenetic distributions of cheaters, we provide an integrative

framework to evaluate the strength of constraints upon cheaters in the mycorrhizal

mutualistic symbiosis, linking land plants to fungi, where non-photosynthetic plants

(mycoheterotrophs) repeatedly evolved. Unlike mutualistic autotrophic plants, cheaters

appeared narrowly specialized toward some closely-related specialist fungi. This shows

that (i) cheaters are specifically isolated into modules by interaction constraints, and (ii)

mycoheterotrophic lineages convergently interacted with 'cheating-susceptible' fungal

partners, breaking any phylogenetic conservatism.

Beyond mycorrhizal systems, our approach highlights that cheating emergences in

multiple-partners mutualisms are strongly limited by interaction constraints, ensuring

the overall stability of mutualism.

Keywords: mutualistic networks, cheating, stability of mutualism, constraints upon

cheating, nestedness, symbiosis, interactions, modularity, arbuscular mycorrhiza,

mycoheterotrophy.

Introduction

Mutualistic interactions are ubiquitous in nature and largely contribute to the origin and maintenance of biodiversity (Bronstein 2015). In mutualism, benefits often come at a cost for partners; hence some species evolved an adaptive uncooperative strategy by retrieving benefits from an interaction without paying the associated cost, namely *cheaters* (Sachs et al. 2010). Cheating strategies compromise the evolutionary stability of mutualisms (Ferriere *et al.* 2002), yet their emergence must be constrained by factors that guarantee the persistence of mutualism (Bronstein *et al.* 2003; Frederickson 2013; Jones *et al.* 2015). For instance, species could favor the most rewarding partners (e.g. conditional investment; Roberts & Sherratt, 1998), stop interactions with non-beneficial partners (Pellmyr & Huth, 1994), or even sanction them (Kiers et al. 2003). Cheating emergence would thus be constrained through physiological or biochemical mechanisms at work during the interaction; this type of constraints is hereafter referred as *interaction constraints*. In addition, ultimate factors such as *phylogenetic constraints* could affect the likelihood of cheaters emergence, especially if species tend to retain an ancestral interaction niche (i.e. partners or some functional traits; Gómez *et al.* 2010). When partners are vertically transmitted, the absence of partner choice strongly impairs the rise of cheaters (Sachs et al. 2004).

Understanding the constraints that actually limit the emergence of cheaters in mutualisms is essential, but we lack a general framework for this purpose. Nonetheless, bipartite networks—can be used as frameworks to assess the relative effects of interaction constraints on cheaters emergence. Although bipartite networks have been extensively used to showcase the properties of mutualistic interactions (Bascompte et al. 2003, Rezende *et al.* 2007, Martos et al. 2012), there is still little insight on the

patterns of cheaters within mutualistic networks (e.g. their level of *specialization*,

nestedness, or *modularity)*, and the constraints shaping them (Fontaine et al. 2011).

Regarding specialization, Joffard et al. (2018) for instance showed that orchid

specialization toward pollinators was higher in deceptive cheaters than in cooperative

nectar-producing species. Considering the overall effect of cheaters on network

structure, Genini et al. (2010) showed that a network dominated by actual pollinators

was nested, whereas another network dominated by nectar thieves was more modular.

Mutualistic interactions are generally nested, i.e. specialists establish asymmetric

specialization with highly generalist partners (Bascompte & Jordano 2014). Conversely,

a high modular structure, where partners establish reciprocal specialization, is expected

in antagonistic interactions (Thebault & Fontaine 2010). Coupled with phylogenetic

trees, bipartite networks reflect the strengths of phylogenetic constraints. It determines

whether cheaters emerged a unique *versus* several times (i.e. whether cheating involves

some rare and constrained evolutionary innovations to change the functioning of the

interaction; Pellmyr *et al.* 1996), and whether 'cheating-susceptible' partners are

phylogenetically related or not (i.e. whether a susceptibility to be cheated exist in a clade

of partners; Merckx *et al.* 2012).

The arbuscular mycorrhizal symbiosis between plant roots and soil Glomeromycotina

fungi is a choice system for evaluating the strength of both types of constraints, as

cheating independently emerged multiple times. Indeed this mutualism is one of the

most ancient and widespread in terrestrial ecosystems, concerning c. 80% of extent land

plants and several hundreds fungal taxa (Davison et al. 2015). Arbuscular mycorrhizal

fungi provide host plants with water and mineral nutrients, in return for carbohydrates.

Although obligate, this symbiosis is generally unspecific and diffuse (van der Heijden et

al. 2015), since multiple fungi colonized most plants, and fungi are usually shared among

surrounding plant species (Verbruggen et al. 2012). Thus, fungi interconnect plant

individuals of different species, and move carbohydrates between plants (Selosse et al.

2006). This feature specifically allows the emergence of achlorophyllous cheating plants,

called mycoheterotroph (MH) plants, which obtain carbon from their mycorrhizal fungi

(Selosse & Rousset 2011). Unlike other cheating systems where cheating cost is shared

between partners (e.g. in plant pollination), MH cheaters involve not only a direct cost to

their fungal partners but also a projected cost (i.e. a cost transmitted through the

network) on the interconnected autotrophic (AT) plants, which supply their carbon.

Finally, we distinguish species that are entirely MH over their lifecycle (*EMH*), and

species that are only initially MH at early stage before turning AT at later stages (*IMH*).

Among preliminary insights about constraints upon MH cheating, it is believed that MH

plants are specialists interacting with few fungal species (Leake, 1994; Merckx, 2013).

However, whether or not these species are unusually specialized compared with overall

AT plants is still debated (Merckx *et al.* 2012). By specializing on few fungal species, MH

plants would evolve more efficient nutritional stealing strategies (Blüthgen et al. 2007)

and thus override interaction constraints. Mycorrhizal networks are generally nested

(Chagnon et al. 2012), but how MH plants affect the structure of mycorrhizal networks

has yet to be investigated. For instance, because they indirectly rely on AT plants for

carbon nutrition, we would expect MH species to interact more or less specifically with

highly generalist fungi, thereby having access to various carbon sources. Conversely,

because of the projected cost, AT plants could sanction interactions with fungi

associated with MH plants: this would isolate cheating interactions within antagonistic

modules, although establishment of extreme reciprocal specialization seems also very

unlikely in this system since a AT source is required. Otherwise, MH cheating strategies

evolved multiple times (Merckx 2013), generating monophyletic families of exclusively

MH plants, but Merckx et al. (2012) showed that fungi interacting with independent MH

families are phylogenetically close. If this result were confirmed in a larger phylogenetic

context including fungi of AT plants, it would evidence strong phylogenetic constraints

upon MH emergence on the fungal side. Also, one interesting question has so far been

disregarded: were these MH-susceptible fungi already present in the ancestral

interactions of MH lineages, or were they horizontally acquired during MH emergence?

In this paper, we first develop a general framework in bipartite networks (interaction

matrix coupled with available phylogenies) to assess the strengths of interaction and

phylogenetic constraints upon cheaters emergence in mutualisms. We apply this

framework to the largest database on arbuscular mycorrhizal fungi and their host plants

(Öpik et al. 2013), which includes not only many AT plants but also the majority of MH

plants. We investigate the phylogenetic distributions of MH plants and fungi in both

phylogenies, and analyze the effects of MH interactions on the network specialization

and structure.

Materials and Methods

Framework to assess the strength on constraints upon cheating

We developed an integrative framework to evaluate the strength of both interaction and phylogenetic constraints (Fig. 1). Firstly, interaction constraints expectedly affect the interactions between cheaters, cheated partners and other cooperative species. We used a global network approach, where all locally described interactions between species are merged and studied at larger scales (e.g. Joffard et al., 2018). By characterizing the relative specialization of cheaters and their partners and the overall structure of the global network (e.g. nestedness), we expect to snap the strength of interactions constraints on cheaters. We expect strong interaction constraints on the 'cheaters' side (resp. 'partners' side) to drive a specialization of cheaters toward few cheated partners (resp. of the cheated partners toward few cooperative species). Strong constraints on both sides drive reciprocal specialization and isolation of cheating into modules, and thus decrease nestedness.

Secondly, phylogenetic constraints expectedly affect the phylogenetic distributions of cheaters and their partners. We measured patterns of clustering and phylogenetically compared the sets of partners. We expect strong phylogenetic constraints on the 'cheaters' side (resp. 'partners' side) to drive a phylogenetic clustering of the cheaters (resp. of the cheated partners). Comparing the cheated partners to the partners of their closest cooperative relatives indicates whether sets of partners have drastically changed when cheaters emerged (i.e weak constraints), or derived from the inherited ancestral partners (i.e strong constraints).

The overall strength of constraints upon cheating (from weak effect to strong limitation)

may be deduced from an integrative analysis of these different patterns (Table S7).

MaarjAM database and interaction matrix

MaarjAM is a web-based database (http://maarjam.botany.ut.ee; access in October

2017) of publicly available sequences of Glomeromycotina fungi, with information on

the host plants, geographical location and biomes for the recorded interactions (Öpik et

al. 2010, Davison et al. 2015). Among the 29,410 interactions between plants and

Glomeromycotina, we filtered out the data from MaarjAM to keep the fungi satisfying the

following criteria: (i) 18S rRNA gene sequence available, (ii) fungus identified from plant

roots (excluding soil samples and fungal cultures), (iii) interaction in a natural

ecosystem (excluding anthropogenic ecosystems), (iv) host plant identified at the

species level, and (v) a virtual taxon (VT) assignation is available in MaarjAM. In

MaarjAM, VT is a classification of arbuscular mycorrhizal fungi designed by applying a

≥97% sequence similarity threshold to the 18S rRNA sequences, and by running

phylogenetic analysis to ensure VT monophyly (Öpik et al. 2013). The filtered dataset

yielded a worldwide binary interaction matrix of 344 plant species (hereafter called

'plant'), 314 VT (hereafter called 'fungus'), and 15,207 interactions.

Phylogenetic reconstructions

We aligned consensus sequences of the 314 fungi with the software MUSCLE (Edgar

2004), and ran a Bayesian analysis using BEAST2 to reconstruct the fungal phylogeny

(Bouckaert *et al.* 2014, see Supplementary methods). The phylogenetic relationships

between the 344 host plants were obtained by pruning the time-calibrated supertree

from Zanne *et al.* (2013) using Phylomatic (http://phylodiversity.net/phylomatic/). We

also used the Open Tree of Life website (http://opentreeoflife.org) and the *rotl* package

(Michonneau et al. 2016) of R (R Core Team, 2018) for grafting 11 plant taxa missing in

the supertree (as polytomies at the lowest higher taxonomy level possible, see

Supplementary methods). Tree root calibrations were set at 505 million years (My) for

the fungi (Davison *et al.* 2015) and 440 My for the plants (Zanne *et al.* 2013).

Outcomes of the interactions

We assigned each plant species to its outcome of its interaction with fungi according to

its carbon nutrition mode: autotroph (AT, n=310, 90.1%), entirely mycoheterotroph

(EMH, n=25, 7.3%), or initially mycoheterotroph (IMH, n=9, 2.6%). Identified on a on-

line database (http://mhp.myspecies.info/

category/myco-heterotrophic-plants/) and individual publications (Boullard, 1979;

Winther & Friedman, 2008; Field et al. 2015), EMH species of the dataset belong to five

monophyletic families [Burmanniaceae (13 spp.), Gentianaceae (6 spp.), Triuridaceae (4

spp.), Corsiaceae (1 sp.), and Petrosaviaceae (1 sp.)], and IMH species belong to the

families Ophioglossaceae (ferns; 3 spp.) and to the Lycopodiaceae (clubmoss; 6 spp.). We

assigned each fungus to three categories: 'AT-associated' if the fungus interacts with AT

plants only (n=260, 82.8%), 'EMH-associated' if the fungus interacts with at least one

EMH plant (n=40, 12.7%), 'IMH-associated' if the fungus interacts with at least one IMH

plant (n=15, 4.7%), or 'MH-associated' if the fungus interacts with at least one EMH or

IMH plant. Only *Glomus* VT130 was both EMH- and IMH-associated.

Network nestedness and specialization of cheaters

In order to assess the strength of the interactions constraints, we tested the effect of MH cheating on the network structure. Firstly, we measured nestedness in: (i) the global network (344 plants, 314 fungi, and 15,207 interactions), (ii) the network of AT plants (310, 308, and 15,016) and (iii) the network of EMH and IMH plants (34, 54, and 191), using the function '*NODF2*' in the R package '*bipartite'* (Dormann et al. 2008). Positive NODF values indicate nested networks.

We tested the significance of nestedness values by using two types of null models ($N=$ 100 for each type): both maintain the connectance (proportion of observed interactions) of the network, but the first model (*'r2dtable'* from *'stats'* R package - *null model 3*) also maintains the marginal sums while the less stringent second model (*'vaznull'* from '*bipartite'* R package - *null model 2*) produces slightly different marginal sums (interactions are randomized with species marginal sums as weights, and each species must have at least one interaction). We calculated the Z-score, which is the standard deviation between the observed value and the mean of the distribution of null-model networks (Z-scores greater than 1.96 validates a significant nestedness with a alpha risk of 5%).

Secondly, the detection cases of extreme reciprocal specializations, leading to independent modules, was performed using projected degrees, i.e. degrees obtained by creating a unipartite network of plants interacting together if they share at least one fungus (the degree (k) is the number of partners with which a given plant or fungus interacts in the network).

Thirdly, to further evaluate the specialization of MH cheaters, several network indices

we calculated for each plant and fungus (i.e., each node) in the network. The degree (k)

is high (resp. low) when the species is generalist (resp. specialist). The partner

specialization (*Psp*) is the mean degree (k) averaged for all the partners for a given plant

or fungus (Taudiere *et al.* 2015): a high (resp. low) *Psp* characterizes a species

interacting mainly with generalist (resp. specialist) partners. Low degree k and partner

specialization *Psp* are signs of reciprocal specialization.

In order to detect specialization at clade scale toward partners, for any given clade of

every node in the plant or fungus phylogenies, we calculated the partner fidelity *Fx* as

the ratio of partners exclusively interacting with this particular clade over the total

number of partners interacting with it. We consider the clade as 'faithful' and the

corresponding set of partners as 'clade-specific' when *Fx*>0.5 (i.e., more than 50%

exclusive partners).

We tested whether the network indices k and *Psp* were statistically different among AT,

EMH and IMH plants using non-parametric Kruskal-Wallis tests and pairwise Whitney U

tests. We also replicated the statistical tests without the IMH Lycopodiaceae, which

showed different network patterns (see Results). We use an analysis of covariance

(ANCOVA) to test the effect of the interaction outcomes on partner fidelity *Fx* accounting

for clade size, which corrects the bias of having high partner fidelity *Fx* in older clades

including many plant species. Similarly, analyses were conducted from the fungal

perspective to test the effect of the three categories 'AT-associated', 'EMH-associated'

and 'IMH-associated'.

To assess the significance of k and Psp values, null-model networks (N= 100) were built

using the function '*permatfull'* in '*vegan'* R package *(null model 1)* with same connectance

but different marginal sums.

Phylogenetic distribution of cheating

In order to assess the strength of the phylogenetic constraints, we explored the

phylogenetic distribution of MH cheaters and MH-associated fungi. Firstly, we

investigated the phylogenetic distribution of mycoheterotrophy, i.e. if MH plants and

MH-associated fungi are more or less phylogenetically related than expected by chance

(i.e. patterns of clustering versus overdispersion). We computed the net relatedness

index (NRI) and the nearest taxon index (NTI) using the '*PICANTE'* R package (Kembel et

al. 2010). NRI quantifies the phylogenetic structure of a species set based on the mean

pairwise distances, whereas NTI quantifies the terminal structure of the species set by

computing the mean phylogenetic distance to the nearest taxon of every species (Gotelli

& Rohde 2002). To standardize the indices, 999 null models were generated for each of

the following option '*taxa.labels'* (shuffles the taxa labels) and '*phylogeny.pool'*

(randomizes interactions by affecting probability to species according to phylogenetic

distances). Significant positive (resp. negative) NRI and NTI values indicate phylogenetic

clustering (resp. overdispersion). We computed these indices (i) on the plant phylogeny

to evaluate the phylogenetic structure of EMH and IMH plants distribution, and (ii) on

the fungal phylogeny to investigate if MH-associated fungi are phylogenetic structured

(we tested the distribution of MH-, EMH-, and IMH-associated fungi, and then of the

fungi associated with each specific MH family). Similarly, for each species, we computed

the partners' mean phylogenetic pairwise distance (*MPD*) that is the mean of

phylogenetic distances between every pair of partners (Kembel *et al.* 2010): a low value

of *MPD* indicates that the set of partners is constituted of closely related species. The

effect of the MH cheating on *MPD* values and its significance was evaluated as for k and

Psp values.

Secondly, we aimed to compare in an evolutionary framework the sets of fungi

associated with plants with different interaction outcomes. To do so, we computed the

unweighted Unifrac distance (Lozupone & Knight 2005) between sets of fungi

interacting with each pair of plants in the network. For each one of the seven MH

families, we compared the Unifrac distances across (i) every pairs of plant species of this

family, (ii) every pairs made of one plant of this family and one plant of the most closely

related AT family (see Table 2 for AT families), (iii) every pairs made of one plant of this

family and one plant belonging to other MH families, and (iv) every pairs made of one

plant of this family and one more distant AT plant (i.e. all AT plants except those of the

most closely related AT family). Differences between groups of distances were tested

using Mann-Whitney U tests.

Results

We analysed the global arbuscular mycorrhizal interaction network filtered from the MaarjAM database combined with the reconstructed phylogenetic trees of both partners (Fig. 2).

Network nestedness and specialization of cheaters

The global network had a significant positive nestedness value (Z-score=11.0, P=1.10^{-28}, Table S3). Nestedness increased when considering only AT plants (Z-score=14.3, P=6.10^{-47}), whereas nestedness was not significant in the network of only MH plants (Z-score=0.79, P=0.21): MH plants weakened nestedness, signifying higher reciprocal specializations in MH interactions. On the side of a main module encompassing most species (335 out of 344 plants and 309 out of 314 fungus; 99,8% interactions), three small independent modules were found (Table S2), as follows: all 6 IMH Lycopodiaceae plants and their 3 fungi (*Glomus* VT127, VT158, VT394); two AT plants from salt marshes (*Salicornia europaea* and *Limonium vulgare*) with one *Glomus* (VT296); and the EMH *Kupea martinetugei* with a unique *Glomus* (VT204).

From the observed degrees (*k*), EMH and IMH plants are significantly more specialized than AT plants by interacting with less fungi (P=$2.8.10^{-13}$, Kruskal-Wallis test; Fig. 3A, Table 1). On the fungal side, EMH- or IMH-associated fungi interact with a lower number of plants than AT-associated fungi (P=0.04). Indeed, partner specializations (*Psp*) confirm that MH plants interact with more specialized fungi (i.e. MH-associated fungi interact on average with fewer plants; P=$7.3.10^{-9}$; Fig. 3A). Reciprocally, on the fungal side, plants interacting with EMH- and IMH-associated fungi are more specialized than plants interacting with AT-associated fungi only (P=0.0005; Table 1). We found similar

evidence for MH reciprocal specializations by reanalyzing the network excluding the

family Lycopodiaceae (Table 1). Significance assessments using null models are in

supplementary files (Table S4).

According to the partner fidelity (*Fx*), very few plant and fungi clades interact with

'clade-specific' partners (i.e. *Fx*>0.5). Instead, most fungi are shared between different

plant clades (Fig. 3C). Among exceptions, however, the whole family Lycopodiaceae

presents a high partner fidelity (*Fx*=1), encompassing the entire Lycopodiaceae-

associated fungi clade (Fig. S3). Similarly, the ANCOVA testing the effect of interactions

outcomes on partner fidelity (accounting for clade size) confirmed that Lycopodiaceae is

the only plant clade significantly presenting a high partner fidelity (P=$3.5.10^{-66}$; Fig. 3C).

While the Lycopodiaceae and their fungal partners were previously shown to form an

independent module, this result demonstrates that the Lycopodiaceae-associated fungi

form actually a monophyletic clade within Glomeromycotina. The estimated age was 265

My for the clade Lycopodiaceae and 44 My for the clade encompassing Lycopodiaceae-

associated fungi (Fig. 3D), which diverged 69 My ago from the other *Glomus* fungi.

Phylogenetic distribution of cheating

Regarding the partners' mean phylogenetic pairwise distance (*MPD*), both EMH- and

IMH-associated fungi are phylogenetically more closely related than AT-associated fungi

(P=$1.6.10^{-6}$; Table 1; Fig. 3B), and reciprocally, they also interact with more closely

related plants (P=$1.2.10^{-4}$). NRI and NTI values (Table S6) confirm a significant

clustering of MH-associated fungi, EMH-associated and IMH-associated fungi on the

fungal phylogeny; this clustering hold at the family level for four main MH families

(namely Burmanniaceae, Triuridaceae, Lycopodiaceae and Ophioglossaceae). For the

plants, only the EMH plants are significantly clustered, and not all MH plants in general,

nor the IMH plants (Table S6). This phylogenetic clustering is visually noticeable on

fungal and plant phylogenetic trees (Fig. S1 and S2). This shows that MH cheating has

evolved several times independently in plants, but interact mainly with closely related

fungi (see also Fig. 2).

Looking specifically at the shared fungi highlighted differences between EMH and IMH

plants (Table 2). While the IMH Lycopodiaceae family forms an independent module

with three private *Glomus*, the other IMH family Ophioglossaceae also interacts with 2

fungi exclusive to this fern family over a total of 12 fungi (*Glomus* VT134 and VT173).

When comparing the fungi shared between MH families (Table 2), mainly two closely

related families, namely Burmanniaceae and Triuridaceae, tend to share some fungi with

other MH families.

By comparing the Unifrac dissimilarities between set of fungal partners according to the

interactions outcome and plant family relatedness, we observed two tendencies among

MH families (Fig. 4; Table S5). Two EMH families, Burmanniaceae and Triuridaceae, had

fungal partners significantly more similar to partners interacting with their closest AT

relatives (P>0.05) than to partners interacting with other AT families (P<4e-03).

Additionally, the fungal partners of families Burmanniaceae and Triuridaceae were also

not significantly different from fungal partners interacting with other MH families. For

other families of EMH (Corsiaceae, Gentianaceae and Petrosaviaceae) or IMH

(Lycopodiaceae and Ophioglossaceae), fungal partners were significantly more similar

to partners interacting with other MH families than to partners interacting with their

closest AT relatives (Table S5).

Discussion

We proposed a framework to assess the strengths of constraints upon mycoheterotroph

(MH) cheating emergences in the mutualistic networks linking plants and arbuscular

mycorrhizal fungi. Firstly, we found a trend toward reciprocal specializations: specialist

MH cheaters seem constrained to interact with rather specialist fungi. We even observed

unexpected, extreme reciprocal specializations for IMH families interacting with

'private' fungi. Secondly, the phylogenetic comparisons of fungal partners highlighted

strong similarities between set of fungi interacting with independently emerged MH

families, which either derived from AT mutualistic relatives, or have been horizontally

acquired. We discuss these results based on the current understanding of the arbuscular

mycorrhizal symbiosis, and argue the roles of constraints upon cheaters in stabilizing

mutualisms.

Cheaters are isolated by reciprocal specialization

Cheaters lower the nestedness in the mycorrhizal network: we confirmed that MH

plants are more specialized on fewer fungal partners (Merckx et al., 2012), and showed

that their fungal partners reciprocally are more specialist than fungi exclusively

associated with AT plants. This contrasts with our prediction from network theory of

nested mutualisms that specialist cheaters interacting with generalist partners (i.e.

asymmetrical specialization) would be more favored and resilient (see Introduction):

the observed trend to reciprocal specialization looks an unstable ecological and

evolutionary strategy for cheating. This instability could explain the relative youngness

of MH clades (Fig. 2), because these cheating clades would not persist on long

evolutionary timescale.

Several alternative, non-exclusive reasons may explain this reciprocal MH specialization.

Firstly, this pattern may very likely result from strong interaction constraints.

Conditional investment and partner choice occur between plants and their fungal

partners (Kiers et al. 2011): plants and fungi reward and interact specifically with the

most mutualistic of the many partners they encounter in soil. On the plant side, MH

cheaters may have avoided this constraint in few specific MH-susceptible fungi (Selosse

& Rousset, 2011) with which they are now faithfully interacting through a parasitic

specialization. On the fungal side, fungi transferring nutrients to MH plants have greater

carbon costs for AT plants than other competing cooperative fungi. Consequently, AT

plants' partner choices, tend to minimize interactions with these costlier MH-associated

fungi, which themselves will specialize on few susceptible AT plants. Reciprocal

specialization would result from these interaction mechanisms, and lead to an isolation

of MH cheating in the mutualistic network.

Secondly, MH cheaters might also be limited by the partners they can parasitically

interact with: the MH-associated fungi are maybe less cooperative partners by

themselves, and therefore intrinsically rejected by autotrophs. Cheating plants could

then mainly be interacting with 'cheating' fungi.

Thirdly, we analysed here a global network built from mycorrhizal interactions

described in different ecosystems around the world. Such global analysis is justified by

the very low endemism of arbuscular mycorrhizal fungi, which guarantees the absence

of strong geographic structure (Davison et al. 2015). However, a species can be very

generalist in the local community where actual interactions develop, while it appears

nevertheless as intermediately generalist at the global scale. Thus, while MH-associated

fungi are specialist in the global network, they might be relatively generalist within the

local communities where MH plants live. Moreover, our approach did not consider

species abundances. A plant species can be specialist at the global scale, but locally

largely abundant, and thus being an advantageous target for MH plants, despite

apparent reciprocal specialization. All these potential biases may only be dismissed

thanks to an in-depth sampling of the abundances of mycorrhizal interactions in a MH

local community.

Whatever its origin, the specialization of cheaters was also suggested in other

mutualisms (Genini et al. 2010). A parasitic nature of EMH plants has often been guessed

without direct support (Bidartondo, 2005; Merckx, 2013) in the absence of data on

fitness of fungal partners and surrounding AT plants (van der Heijden *et al.* 2015). Our

analysis is *a posteriori* congruent with the view of EMH plants as parasitic cheaters.

MH cheating emergences convergently target similar susceptible fungi

Our approach confirms that fungal clades interacting with independently emerged MH

cheaters are not numerous and phylogenetically related (Merckx et al., 2012).

Although MH-associated fungi turn out to be very similar and phylogenetically

constrained, the multiple emergences of cheating at different position of the plant

phylogeny indicate that the overall strength of phylogenetic constraints is low.

This weakness likely results from the low specificity in the arbuscular mycorrhizal

symbiosis: convergent interactions (Bittleston *et al.* 2016) arose in different plant clades

toward similar MH-susceptible fungi. Thus, interaction constraints, shaping MH isolation

by reciprocal specialization, is likely the only barrier to cheating emergences in the

arbuscular mycorrhizal mutualism.

The susceptibility of fungi is difficult to discuss, because we know little about

physiological and symbiotic traits of these diverse microscopic fungi (Chagnon et al.

2013; van der Heijden & Scheublin 2007). Yet, interactions between MH cheaters and

MH-susceptible fungi likely represent exceptions to the partner choice, which is

generally considered to constitutively maintain the stability of this mutualism (Selosse &

Rousset 2011).

Our comparisons of the sets of fungal partners according to interactions outcome and

plant family relatedness show two evolutionary pathways. Firstly, the similarity

between fungi associated with the closely related MH families Burmanniaceae and

Triuridaceae (order Dioscoreales) and fungi associated with their most closely related

AT family highlights a phylogenetic conservatism of partners: MH-associated fungi

would have been inherited and derived from the fungal partners of cooperative AT

ancestors. Secondly, the MH families Corsiaceae, Gentianaceae, and Petrosaviaceae

interact with fungi more similar to fungi interacting with other MH families than to fungi

interacting with their closest AT relatives: MH-associated fungi would not derived from

the fungal partners of cooperative AT ancestors, but would have been secondly acquired

from the suitable set of MH-susceptible fungal partners other MH families.

The Dioscoreales (including Burmanniaceae and Triuridaceae) is the oldest clade

including EMH plants (approximately 130 My; Zanne et al. 2013; Fig. 2). Thus, we

speculate that the mycoheterotrophy we observe in EMH plants initially emerged in the

Dioscoreales clade, and secondly, thanks to the weak phylogenetic constraints, the more

recently evolved EMH plant families convergently reutilized the cheating-susceptible

fungal partners.

Private networks and parental nurture in IMH

Among all MH families, only IMH Ophioglossaceae and Lycopodiaceae surprisingly

interact with exclusive fungi, which do not interact with any other plant families. These

fungi are present during MH underground germination and in roots of adult AT

individuals (Winther & Friedman, 2007, 2008). Thus, their carbon source is likely from

AT adult. Leake *et al.* (2008) hypothesized of parental nurture where germinating

spores would be indirectly nourished by surrounding adults: our data further support

cases of parental nurture mediated by exclusive fungi forming private networks.

Importantly, such interactions may not be cheating, since their overall outcome over the

plant lifespan is positive, because fungi invest in MH germinations that represent future

carbon sources ('take now, pay later' model; Field et al. 2015). In other words, our

analysis reveals how IMH plants do not cheat their exclusive fungi, but postpone reward.

Particularly, we demonstrated the extreme reciprocal specialization between

Lycopodiaceae and their exclusive clade of *Glomus*. From a different dataset, Rimington

et al. (2018) showed that early-diverging plant clades interact with early-diverging

fungal clades with the exception of Lycopodiaceae, independently confirming our

pattern. Lycopodiaceae is a 265-My-old clade whereas its fungal partners form a 44-My-

old clade of 3 *Glomus* diverged 69 My ago from all other *Glomus*. Thus, this highly

specific interaction would be a secondly evolved acquisition in Lycopodiaceae.

Lycopodiaceae may have transiently developed IMH cheating from a more generalist

state, which later evolved into a specific mutualistic cooperation by way of parental

nurture, suggesting a strong linked evolution between both clades.

Thus, our framework challenges the cheater status of mycoheterotrophy by highlighting

the different evolutionary meaning of EMH and IMH cheaters: it reveals a dichotomy

between true MH cheating and private MH systems likely cooperative. It further

supports the interest of interaction network analyses coupled with phylogenetic

analyses in unraveling and discussing cheating *versus* cooperative processes.

498 Conclusions

Our analysis of mycoheterotroph cheating in the arbuscular mycorrhizal symbiosis

shows how strong interaction constraints prevent the emergence of cheaters in

mutualisms. Cheating emergence seems to be compromised by reciprocal specialization:

partner choices or sanctions break the nested network into modules, isolating cheaters

and their 'cheating-susceptible' partners. Conversely, we detected limited phylogenetic

constraints: independently emerged cheaters interact with very similar closely related

partners, implying that cheaters convergently interacted with cheating-susceptible

partners.

Although well-established in several independent clades, cheating is constrained to

remain rather infrequent and marginally challenge the stability of the mutualism.

Beyond the mycorrhizal symbiosis, we invite to use our framework to evaluate the

strength of constraints upon cheating in other multiple-partner mutualisms (e.g.

pollination or seed dispersal).

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Tables & Figures

Constraints upon cheating emergence in mutualistic networks: evidence in the mycorrhizal symbiosis

Tables (1 – 2)

Table 1: Effect of interaction outcomes (i.e. plant carbon nutrition modes) on indices of network structure and phylogenetic distributions:

In black: P-values of Kruskal-Wallis tests (each index as a function of the interaction outcome) for the global network. P-values in brackets were calculated in the network without the Lycopodiaceae.

Bold values highlight the indices significantly different according to the interaction outcome (threshold of 5%).

In grey: P-values of Whitney U tests (pairwise tests for each index according to two interaction outcomes) for the global network including Lycopodiaceae.

Index	Plants			Fungal partners		
	AT vs. EMH	AT vs. IMH	IMH vs. EMH	AT vs. EMH	AT vs. MH	IMH vs. EMH
Degree (*k*)	**2.8e-13 (5.8e-11)**			**0.050 (0.039)**		
	2.4e-11	**8.5e-05**	0.60	**0.013**	0.92	0.34
Partner specialization (*Psp*)	**7.3e-9 (3.8e-6)**			**4.7e-4 (0.011)**		
	7.1e-7	**1.7e-5**	**9.9e-3**	0.28	**1.3e-5**	**4.5e-3**
Partner phylogenetic mean pairwise distance (*MPD*)	**1.6e-6 (1.1e-4)**			**1.2e-4 (6.1e-4)**		
	8.6e-4	**6.2e-5**	**7.3e-3**	**2.6e-3**	**1.4e-3**	0.062
Partner fidelity (*Fx*)	**3.5e-66 (2.6e-3)**			**6.4e-12 (/)**		
	0.036	**9.0e-4**	**4.0e-3**		**0.017**	

Table 2: Fungal sharing between mycoheterotroph (MH) cheating families: Number of shared fungi (matrix lower part) and percentage of shared fungi (matrix upper part) between pairs of MH families. The two last columns represent (i) the total number of fungi shared with other MH families, and (ii) the number of fungi specific to this family. The second column indicate, for each MH family, its most closely related AT sister-clade (can be either one family, or a clade of families, or none in the case of the early-diverging isolated family Lycopodiaceae).

	Family	Most closely related AT sister-clade in our dataset	Number of plant species	Number of fungal partners	Burmanniaceae	Corsiaceae	Gentianaceae	Petrosaviaceae	Triuridaceae	Lycopodiaceae	Ophioglossaceae	Total number of shared fungi	Total number of specific fungi
EMH	**Burmanniaceae**	Dioscoreaceae	13	29	/	0%	13%	3%	14%	0%	3%	10	0
	Corsiaceae	Melanthiaceae Liliaceae	1	1	0	/	0%	0%	0%	0%	0%	0	0
	Gentianaceae	Apocynaceae	6	7	4	0	/	0%	6%	0%	0%	4	0
	Petrosaviaceae	Dioscoreaceae Melanthiaceae	1	2	1	0	0	/	0%	0%	0%	1	0
	Triuridaceae	Dioscoreaceae	4	11	5	0	1	0	/	0%	0%	5	1
IMH	**Lycopodiaceae**		6	3	0	0	0	0	0	/	0%	0	3
	Ophioglossaceae	Gleicheniaceae Lygodiaceae Osmundaceae Tectaridaceae	3	12	1	0	0	0	0	0	/	1	2

Figures (1 – 4)

Figure 1: Framework to evaluate the strengths of constraints upon cheating emergences

in multiple-partner mutualisms.

This general framework proposes to evaluate in parallel the interaction constraints (IC)

phylogenetic constraints (PC) upon cheating emergences. These constraints affect the

structure of the interaction network (level of specialization of cheaters and their

partners) and the phylogenetic distributions of cheating (phylogenetic clustering of the

cheaters and their partners). Therefore, our approach is based on the investigation of

specializations and phylogenetic clusterings on the "cheater side" and on the "partner

side". These investigated patterns are considered as proxies of the strengths of both

constraints on both sides. Possible combinations of the strengths of phylogenetic

constraints and interaction constraints and their overall consequences on the stability of

the mutualism are presented in Table S7.

Figure 2: Mycoheterotroph (MH) cheating in the global arbuscular mycorrhizal

mutualism:

Plant phylogenetic tree (left - 344 plant species) and fungal tree (right - 314 arbuscular

mycorrhizal fungi) are linked by the observed interactions between plants and fungi

(15,207 interactions). The colors of the links correspond to the interaction outcome (i.e.

the plant carbon nutrition modes, which are AT: autotrophic; EMH: entirely

mycoheterotrophic; and IMH: initially mycoheterotrophic). Main plant and fungal clades

are captioned. Cheaters encompass 25 EMH plants in 5 families, and 9 IMH in 2 families.

Figure 3: Effect of the interaction outcomes on specializations (k and Psp), partner's phylogenetic distributions (MPD), and partner fidelity (Fx):

(Categories are defined according to the plant carbon nutrition modes, i.e. AT: autotrophic; EMH: entirely mycoheterotrophic over development; and IMH: initially mycoheterotrophic in the development).

A: plant degree (k) against plant partner specialization (Psp) (i.e. average degree of the arbuscular mycorrhizal fungal partners); dots in the bottom left corner indicate reciprocal specialization.

B: Partner's mean phylogenetic pairwise distance (MPD) of the sets of fungal partners. Boxplots present the median surrounded by the first and third quartile, and whiskers extended to the extreme values but no further than 1.5 of the inter-quartile range.

C: Fidelity toward fungal partners in relation to the age of the plant clade; note that brown dots (clades of Lycopodiaceae) depart from other MH clades. Clades are defined according to their main carbon nutrition mode of their plants (over 50%).

D: Independent interaction sub-network between of the clubmoss family Lycopodiaceae (rows) and their three arbuscular mycorrhizal fungi (columns) with their respective phylogenetic relationships.

Figure 4: Dissimilarities between sets of fungal partners associated with different MH

plant families:

For each MH family, Unifrac dissimilarities of sets of fungal partners are calculated

between one particular MH species belonging to the focal MH plant family and another

plant species (from the same family, from the closest related AT family, from other MH

families, or from other AT plant families). All the groups cannot be calculated for every

MH family, due to: (i) single species within families Corsiaceae and Petrosaviaceae, and

(ii) difficulty to define the most closely related AT family for Lycopodiaceae.

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